

Ambiguous, Informal, and Unsound:
Metaprogramming for Naturalness

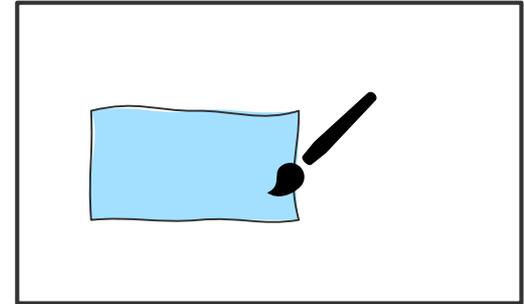
Toni Mattis, Patrick Rein, Robert Hirschfeld

Software Architecture Group

Hasso Plattner Institute, University of Potsdam, Germany

META'19 20 Oct. 2019, Athens, Greece

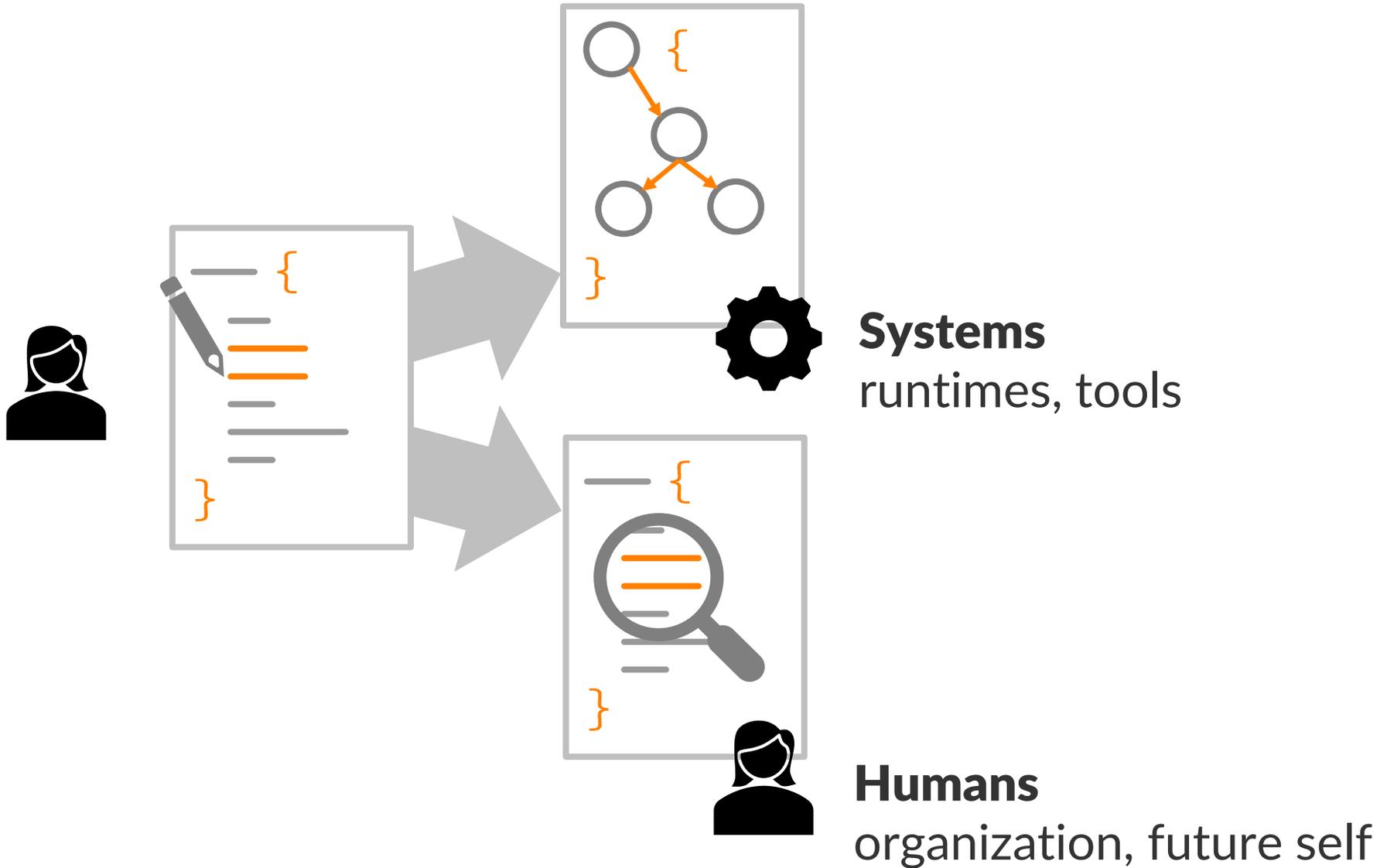
```
Rectangle >> drawOn: aCanvas
  self visible ifTrue:
    [aCanvas paint: self bounds
      color: self color]
```



```
Rectangle >> drawOn: aCanvas
  self visible ifTrue: [aCanvas paint: self bounds
    color: self color]
```

```
Penguin >> slipOn: anIceFloe
  self clumsy ifTrue: [
    anIceFloe paint: self bounds
      color: self color]
```







Primary notation

Behaviorally significant



Secondary notation

Perceptually significant

```

[class]      [method]      [arg]
Rectangle >> drawOn: aCanvas
self visible ifTrue:
  [aCanvas] paint: self bounds
              color: self color]
              [message send] [block]

```

Verbal Cues

```

| Rectangle >> drawOn: aCanvas
  self visible ifTrue:
    [aCanvas | paint: self bounds
              | color: self color]

```

Visual Cues

Primary notation

Behaviorally significant

```
Rectangle >> drawOn: aCanvas
  self visible ifTrue:
    [aCanvas paint: self bounds
     color: self color]
```

- » Formal, unambiguous
- » Soundness guarantees
- » Accessible through Metaprogramming

Secondary notation

Perceptually significant

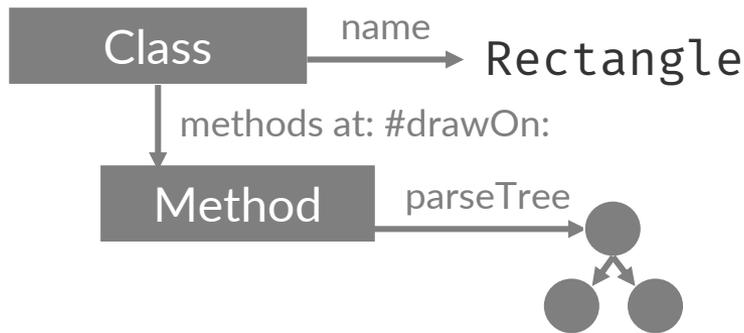
```
Rectangle >> drawOn: aCanvas
  self visible ifTrue:
    [aCanvas | paint: self bounds
     | color: self color]
```

- » Informal, ambiguous
- » Used inconsistently
- » Subject to (**approximate**) interpretation

Primary notation

Behaviorally significant

```
Rectangle >> drawOn: aCanvas
  self visible ifTrue:
    [aCanvas paint: self bounds
     color: self color]
```



» Accessible through Metaprogramming

Secondary notation

Perceptually significant

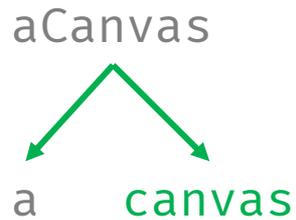
```
Rectangle >> drawOn: aCanvas
  self visible ifTrue:
    [aCanvas | paint: self bounds
     color: self color]
```



» Subject to (approximate) interpretation

Examples of Secondary Notation

Names



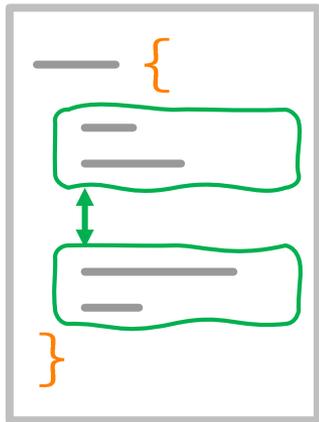
Comments

“Re-**draw** when invalidated”

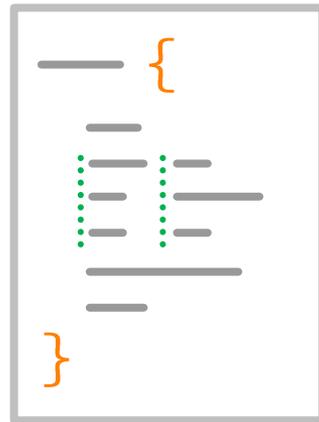
Values

404

‘**error.log**’



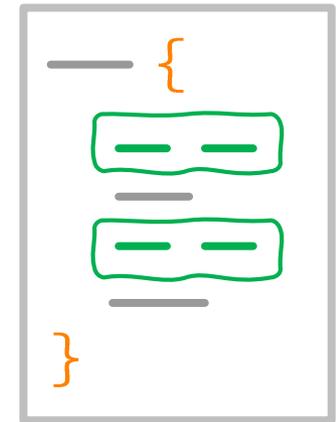
Space



Alignment



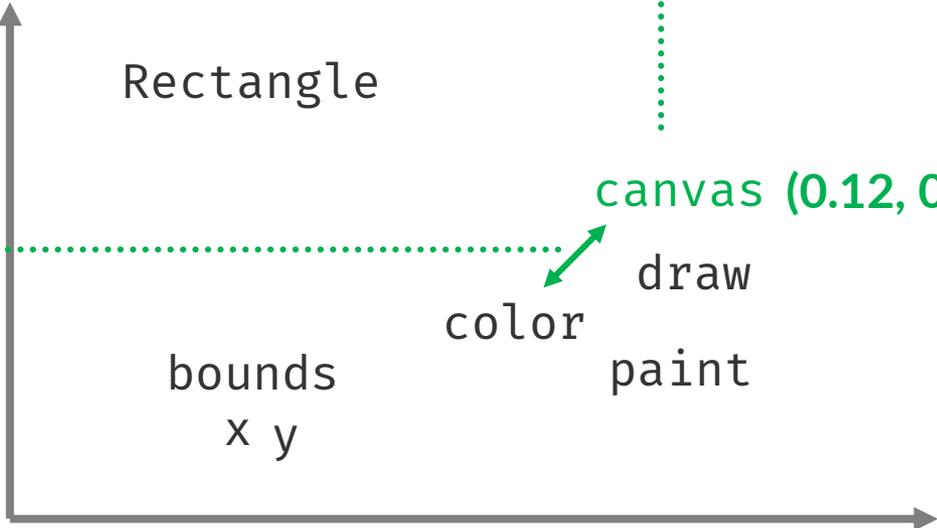
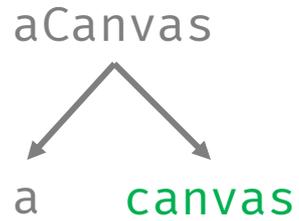
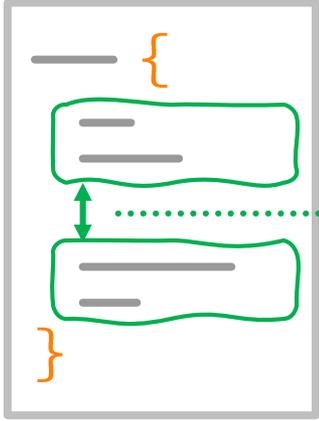
Order



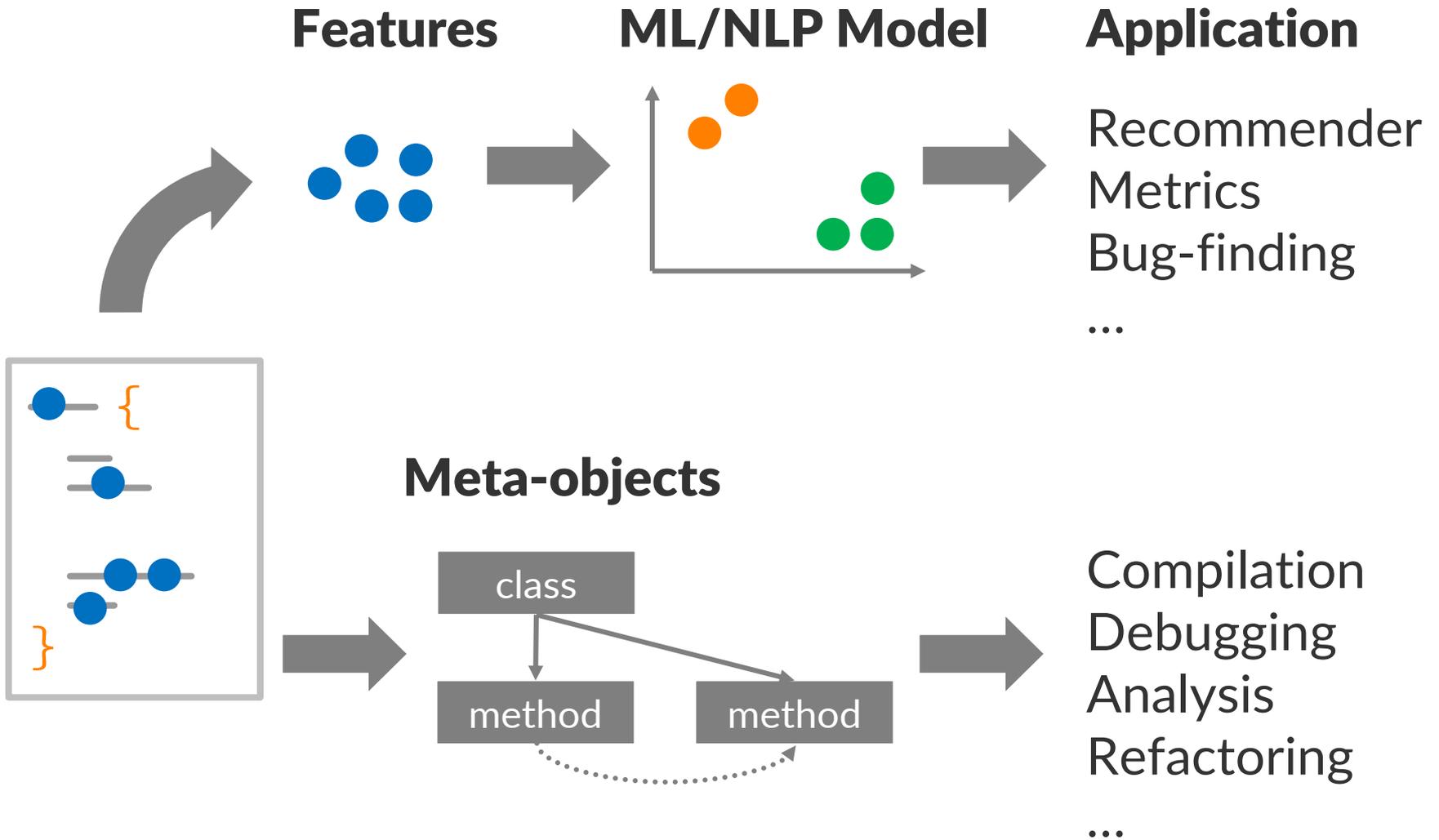
Co-occurrence

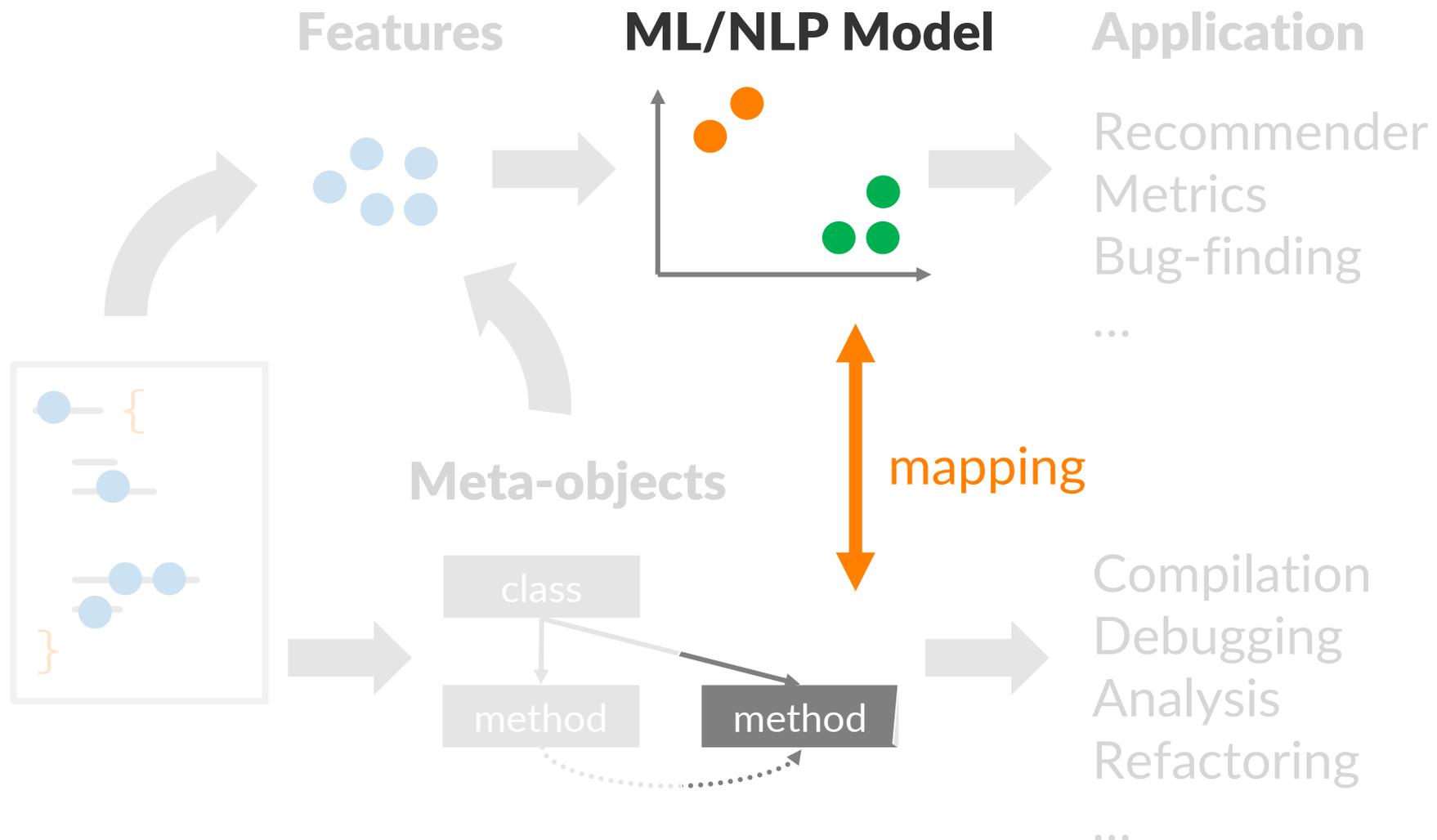
Machine Learning (ML) Example: Word Embedding

ML / Natural Language Processing (NLP)



Vector space





Meta-objects

Reified representations of a program's (formal) elements

Rectangle

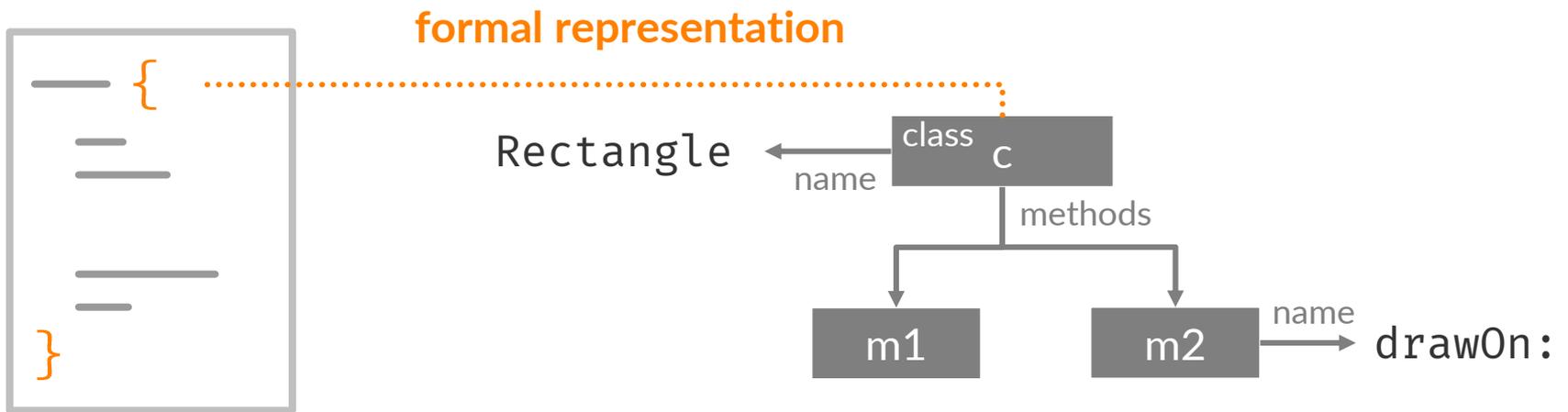
`m := Rectangle methodDict at: #drawOn:`

`m parseTree body first`

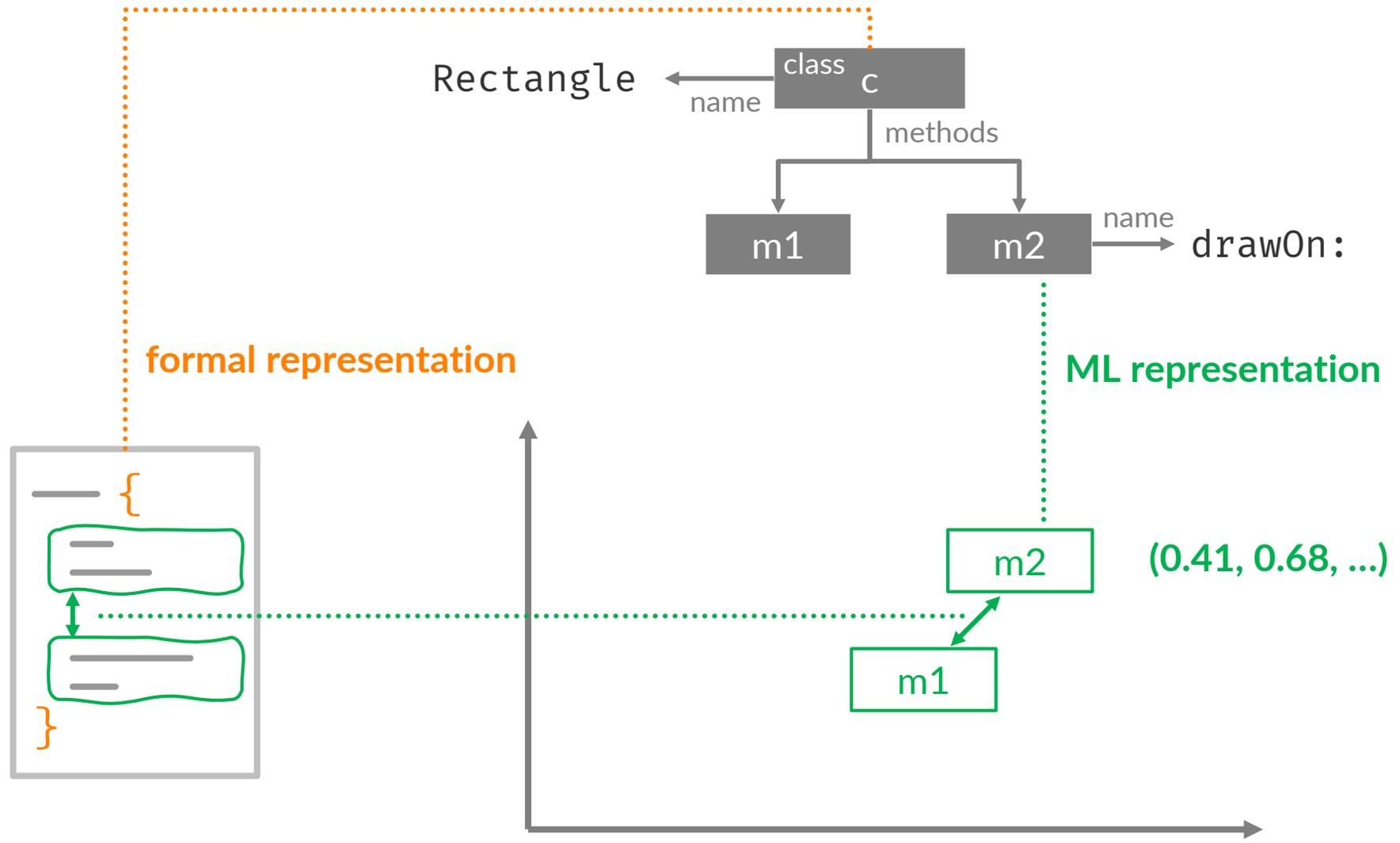
a Class

a CompiledMethod

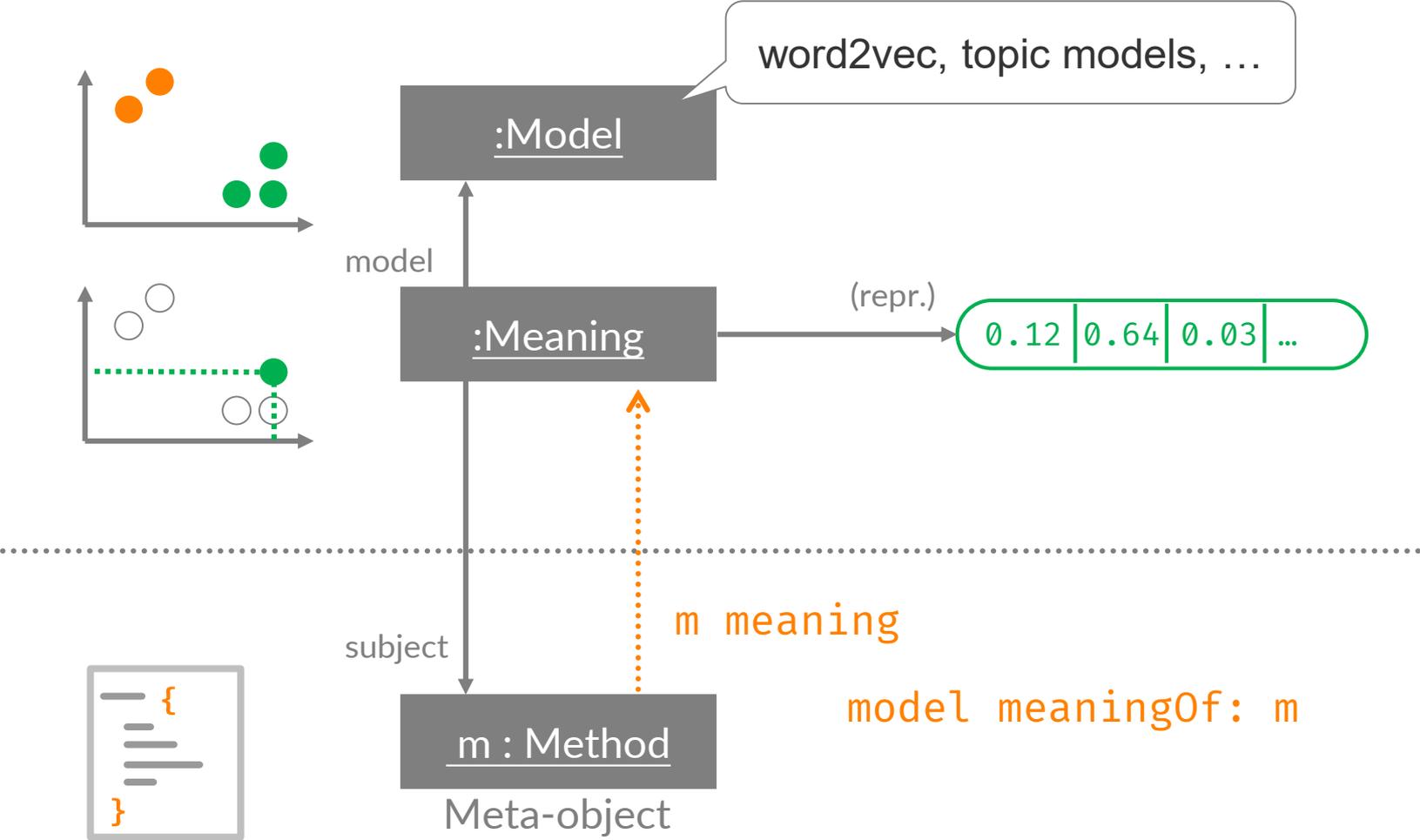
The first statement of m



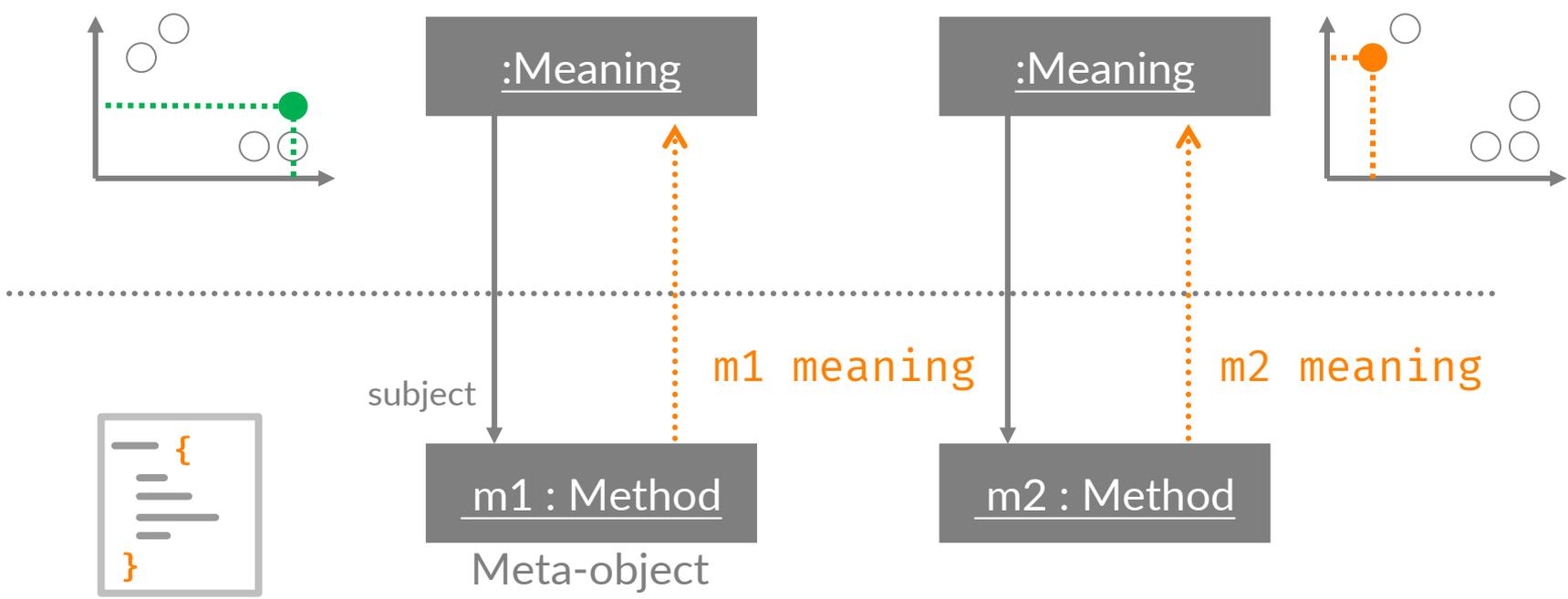
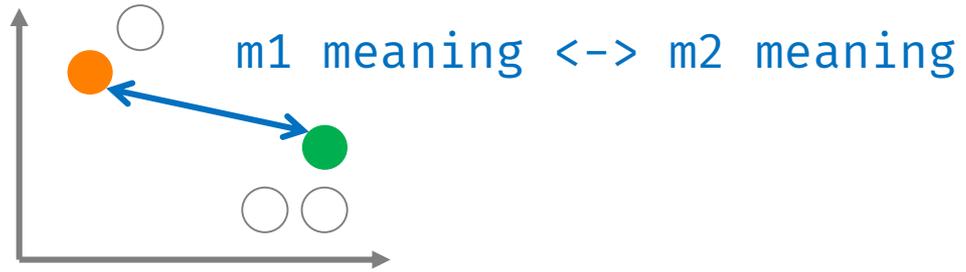
Representing Meta-objects



A Framework for "Meaning"

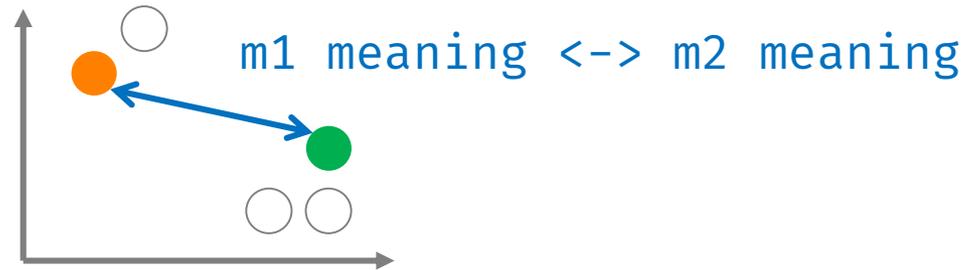


Comparing Meanings



Comparing Meanings

Test Prioritization



Rectangle

drawOn:

bounds

RectangleTest

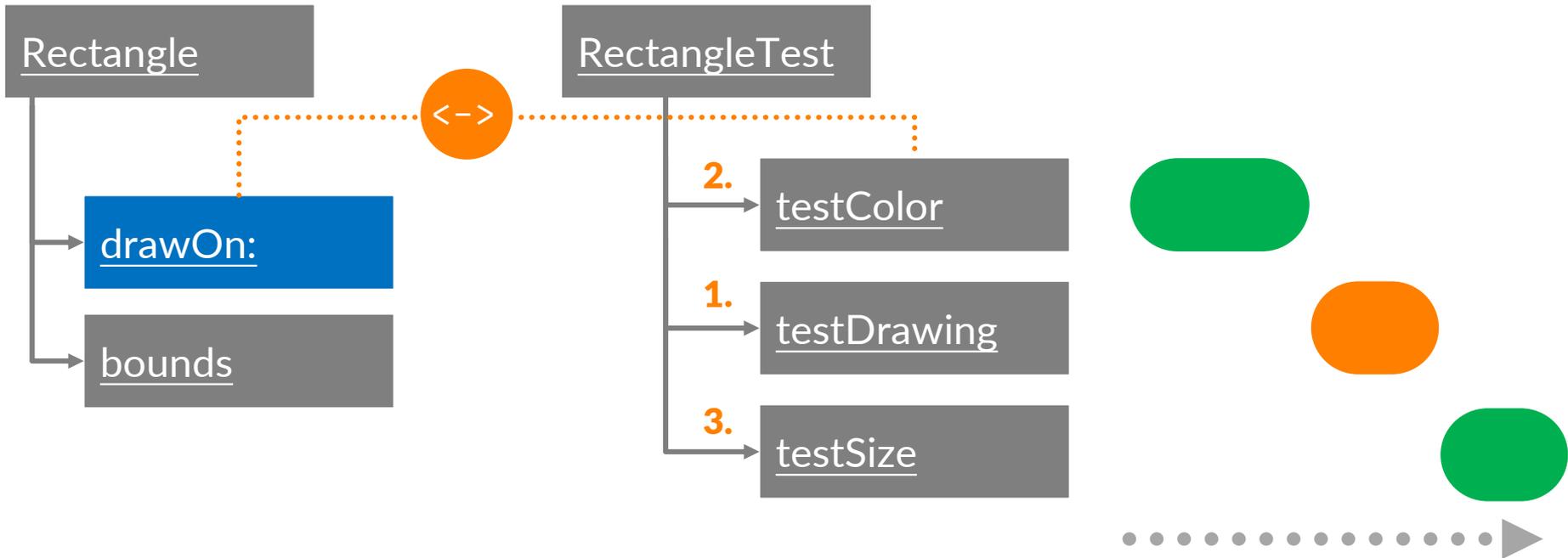
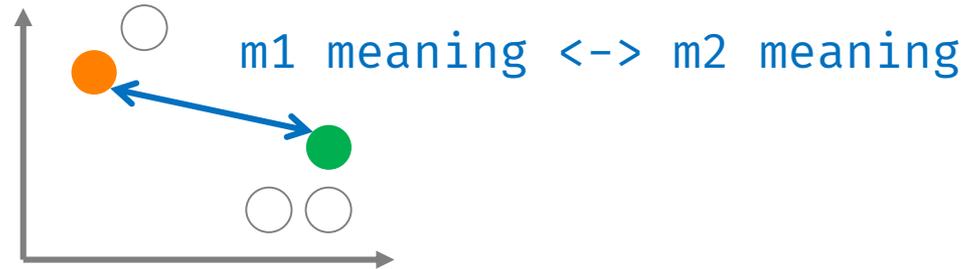
testColor

testDrawing

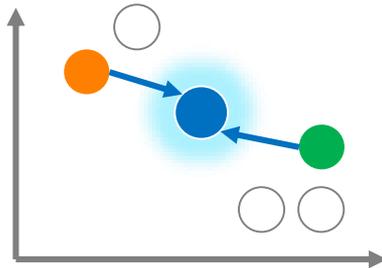
testSize

Comparing Meanings

Test Prioritization



Composition



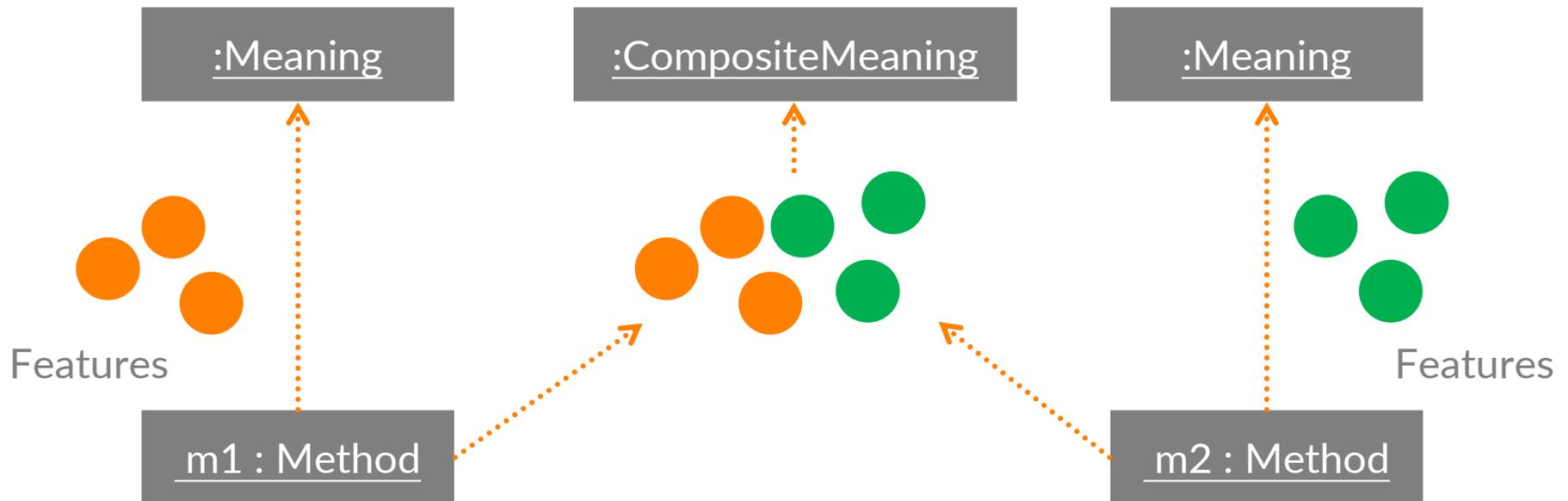
m1 meaning **composeWith:** m2 meaning

Meaning **composedFrom:** {m1. m2. ... }

- » Represent **classes** as composition of name, fields, doc-string, and methods
- » Represent **changes** as composition of modified meta-objects

Destructuring Composition

- » Not all models allow **immediate** composition (e.g. addition in vector space vs. maximum-likelihood)



Use Cases

- » Test Prioritization
- » Refactoring [s. Paper]
- » Metrics/Linting
 - › Intra-class similarity ~ cohesion
 - › Inter-class similarity ~ coupling

- » Code Completion
 - › **Incomplete code** without valid meta-object representation can have a representation in the model

- » ...

Implementation: Scope

```
model := LDAModel trainOn: #package alpha: 0.05 beta: ...
model do: [ "The LDA model is valid here" ]
```

Model >> **do:** aBlock

^ActiveModel value: **self** during: aBlock

Dynamic variable

CompiledMethod >> **meaning**

^ActiveModel value meaningOfMethod: **self**

Class >> **meaning**

^ActiveModel value meaningOfClass: **self**

Double dispatch
back to dynamic
variable

model meaningOf: anObject

More explicit?

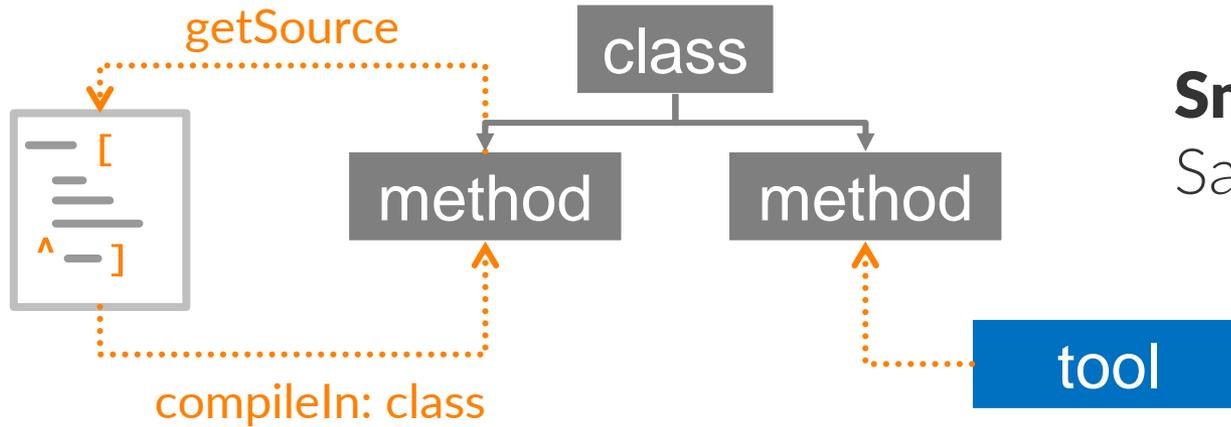
Implementation: Minimal Core

- » A Model only needs to...
 - › represent features
(lexical tokens in identifiers, strings, symbols)
 - › provide composition and comparison

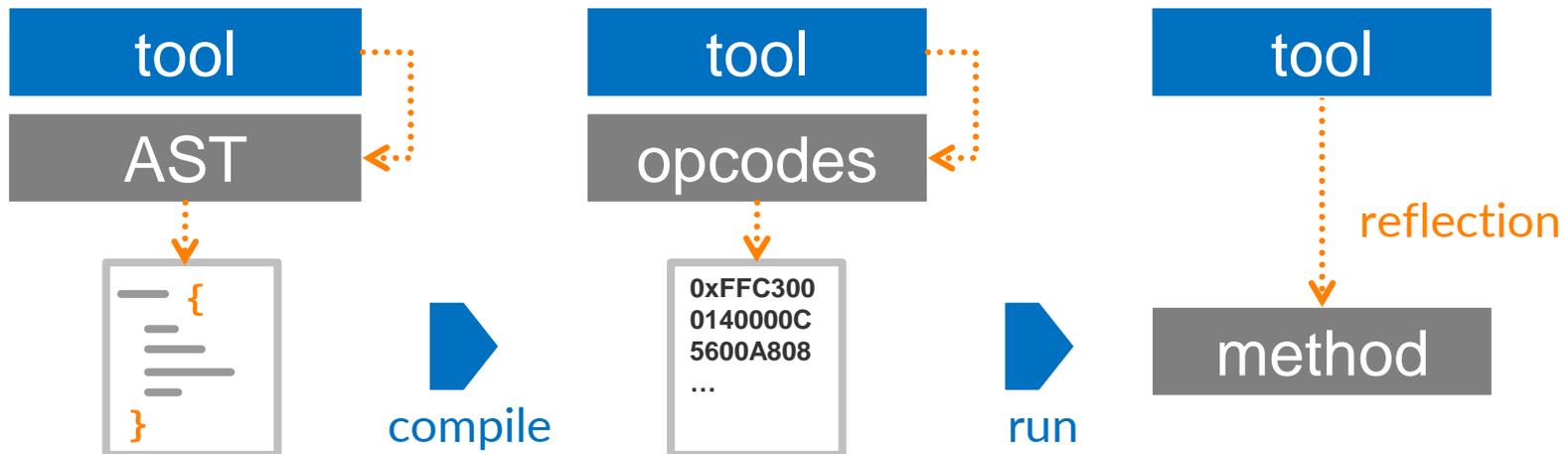
- » Default implementations (via double dispatch)
 - › Methods as composition of identifiers
 - › Classes as composition of name, fields, and methods
 - › ...

Meta-objects?

Smalltalk
Same life-cycle



Java/.NET/C[++]



Conclusion

- » Programs are “natural” artifacts of human communication
- » “Natural” properties are usable through ML but not reified in metaprogramming, yet
- » We explored designs to expose “ML/NLP knowledge” at meta-object level
- » How do we want to use secondary notation & meaning through metaprogramming?

Primary notation	Secondary notation
Behaviorally significant	Perceptually significant
<pre>Rectangle >> drawOn: aCanvas self visible ifTrue: aCanvas paint: self bounds color: self color]</pre>	<pre>Rectangle >> drawOn: aCanvas self visible ifTrue: aCanvas paint: self bounds color: self color]</pre>
<ul style="list-style-type: none"> » Formal, unambiguous » Soundness guarantees » Accessible through Metaprogramming 	<ul style="list-style-type: none"> » Informal, ambiguous » Used inconsistently » Subject to (approximate) interpretation

Machine Learning (ML) Example: Word Embedding

The diagram illustrates a word embedding for the word 'canvas'. A vector space is shown with axes. The word 'canvas' is represented by a vector with components [0.12, 0.94, ...]. This vector is linked to the 'draw' and 'color' methods of the 'Canvas' class. The 'Rectangle' class is linked to 'bounds' and 'x y' attributes. A box labeled 'ML / Natural Language Processing (NLP)' is connected to the vector space.

A Framework for “Meaning”

The diagram shows a framework for meaning. At the top, a 'Model' (containing 'word2vec, topic models, ...') generates a 'Meaning' vector (e.g., [0.12, 0.64, 0.03, ...]). This 'Meaning' vector is then used to generate a 'Method' (Meta-object) with a 'meaningOf' property. The 'Method' is also linked to a 'subject'.

